

# CLARREO sampling studies

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# Approach

- CLARREO focus is to detect climate trends in the inter-annual TOA flux variability spanning decadal time scales over large spatial scales
  - Minimum benchmark requirement is the 10° zonal annual anomaly
  - Also be looking at finer temporal and spatial scales
- The time period to detect a significant trend depends on
  - Magnitude of the natural variability: ENSO, seasonal, diurnal, semi-diurnal, are natural oscillations
  - Magnitude of the trend
  - Calibration error
  - Sampling error
- Design orbit to minimize sampling error and track expected climate signals
  - Design orbits to decrease sampling errors and to observe predicted climate changes, for example polar regions and diurnal surface temperatures
  - Single P90 has the advantage of seeing the poles and processing through seasonal and diurnal cycles and can inter-calibrate other SS satellites
  - The SS13:30 orbit is a historical operational SS orbit and for the future JPSS missions

# Trend detection

- Time it takes to detect a signal above natural variability, with a signal to noise ratio of  $s$

Leroy, J Climate 2008

Natural variability term

Measurement error term

$$\Delta t = \{ [12s^2 / m_{\text{var}}^2] \sigma_{\text{var}}^2 \tau_{\text{var}}^2 \} F_t$$

$$F_t = (1 + \sum f_i^2)^{1/3}$$

$F_t$  is the factor that predicts the deviation from a perfect observing system  
 $F=1$  for perfect system, and  $F>1$  for observing errors in sampling, calibration, etc.

$$f_i^2 = (\sigma_i^2 \tau_i) / (\sigma_{\text{var}}^2 \tau_{\text{var}})$$

Measurement error is expressed as a ratio between measurement error and natural variability

$$\sigma_i / \sigma_{\text{var}} = \sqrt{[F_t^3 - 1][\tau_{\text{var}} / \tau_i]}$$

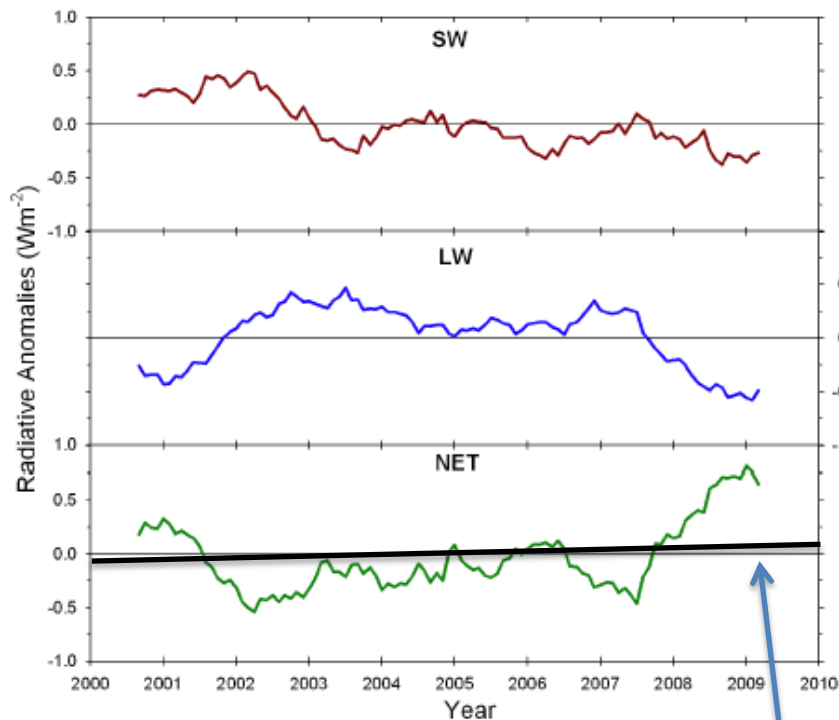
Sampling error/natural variability

- Use Leroy  $\tau_{\text{var}} = 1.5$  years and  $\tau_i = 1.0$  years for annual anomaly studies
- If you allow sampling error to be 10% greater than the perfect observing system, then  $F_t = 1.1$  and  $(\sigma_i / \sigma_{\text{var}}) = 0.70$

$F_t$	1.02	1.05	1.10	1.20	1.50	2.00
$\sigma_i / \sigma_{\text{var}} (\%)$	30	50	70	104	190	324

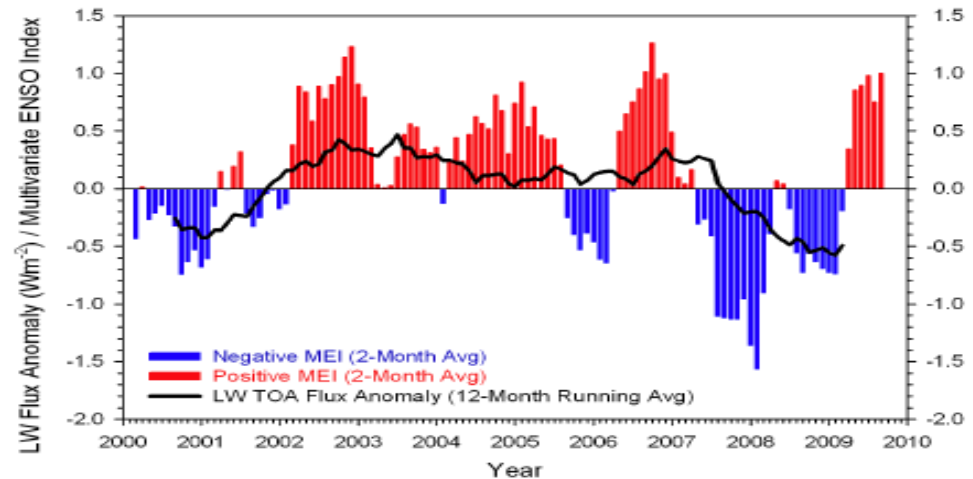
# CERES 10 year flux anomalies (natural variability)

Deseasonalized 12 month running flux means

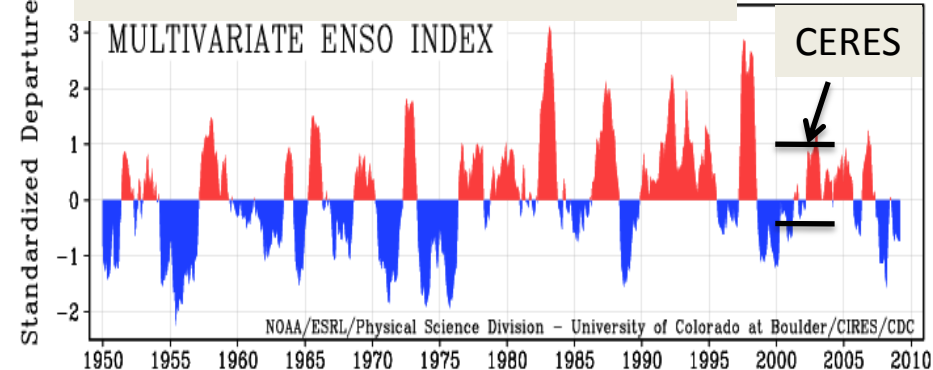


- 0.3Wm<sup>-2</sup>/decade (50% of IPCC predicted forcing)
- 14 years to detect predicted forcing, at the 95% significance level with a probability of 90%

LW flux anomaly with ENSO Index

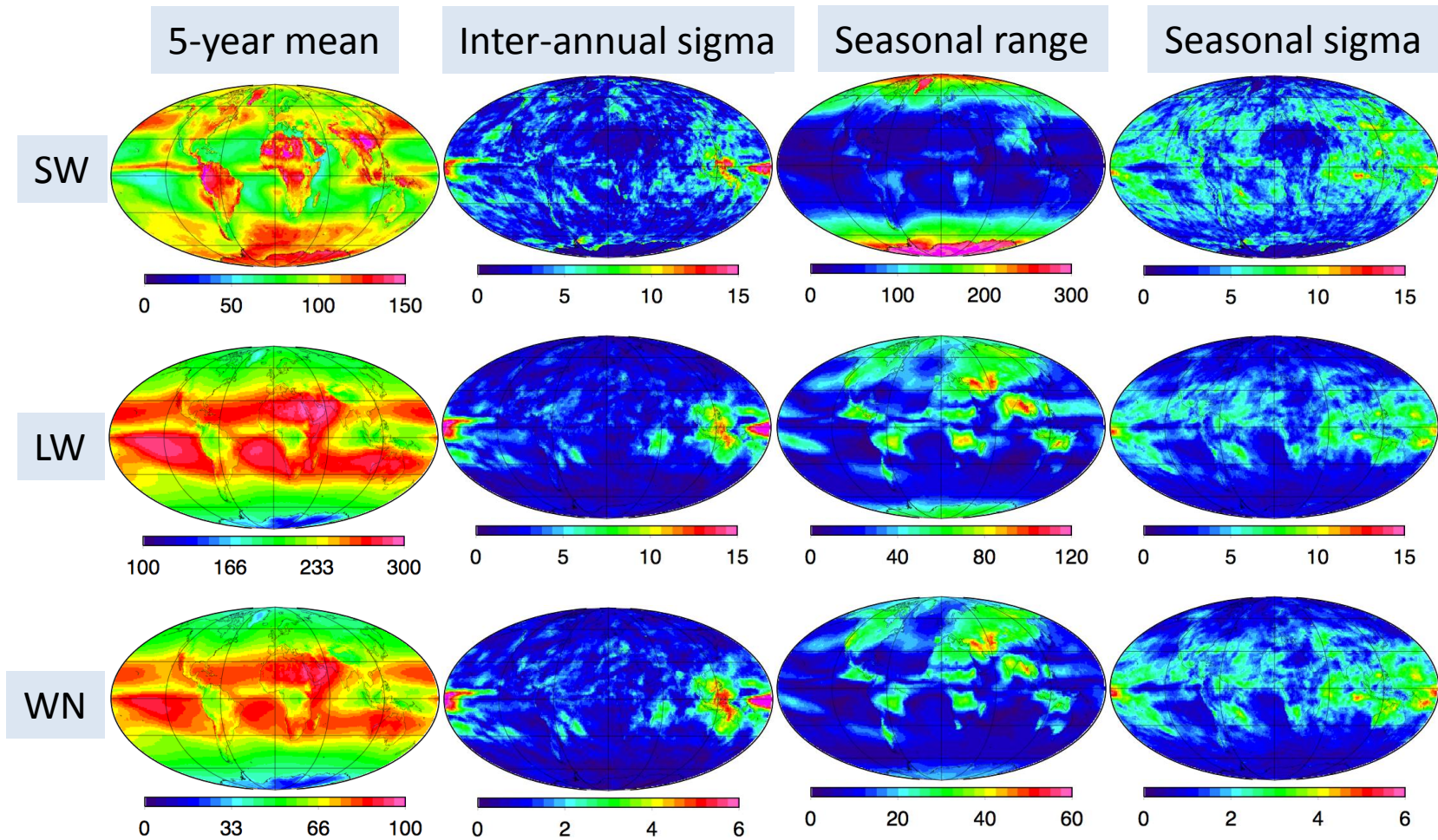


Multivariate ENSO Index 1950-2010

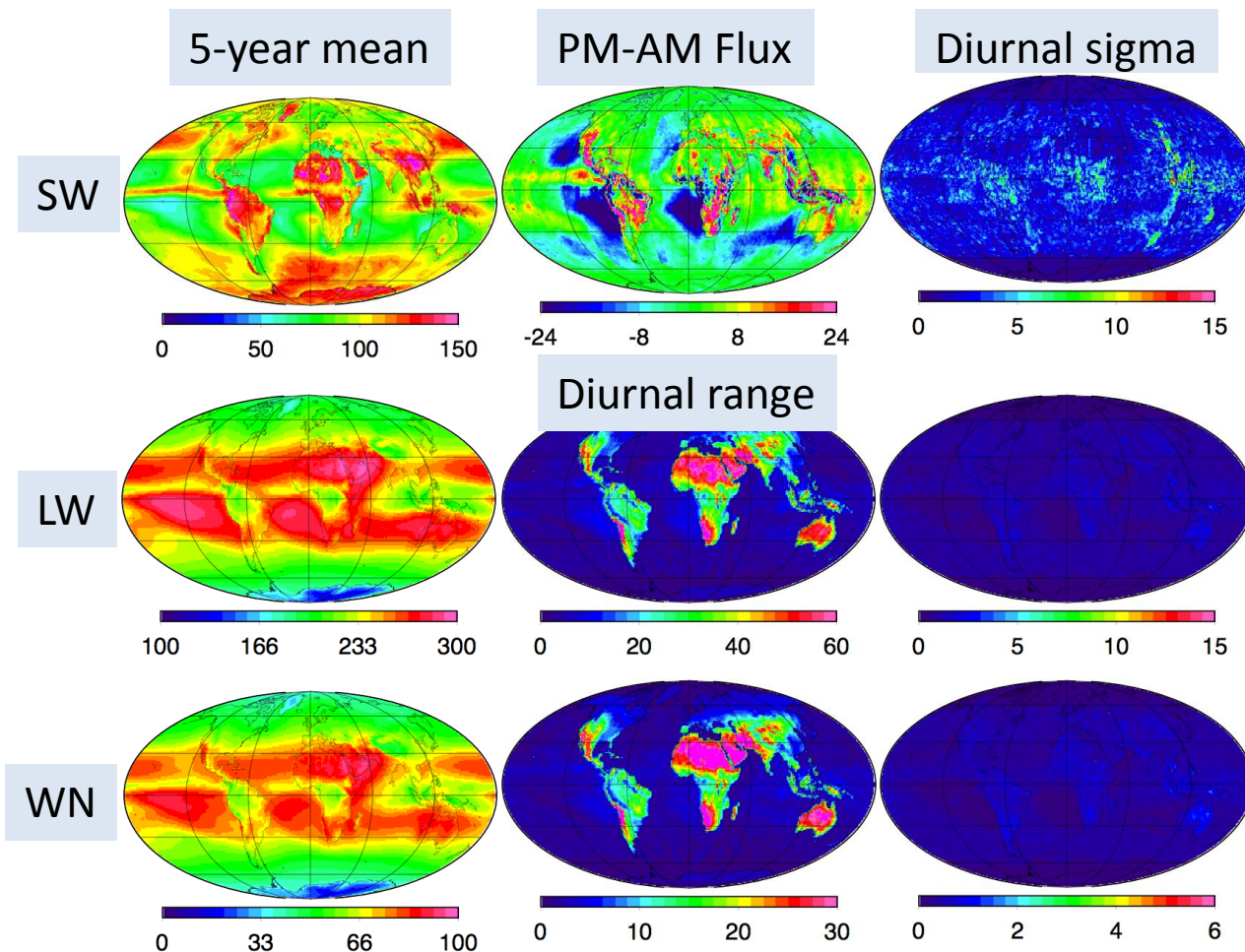


CERES data within low ENSO variability

# Inter-annual and seasonal cycles and variability



# Diurnal cycles and variability

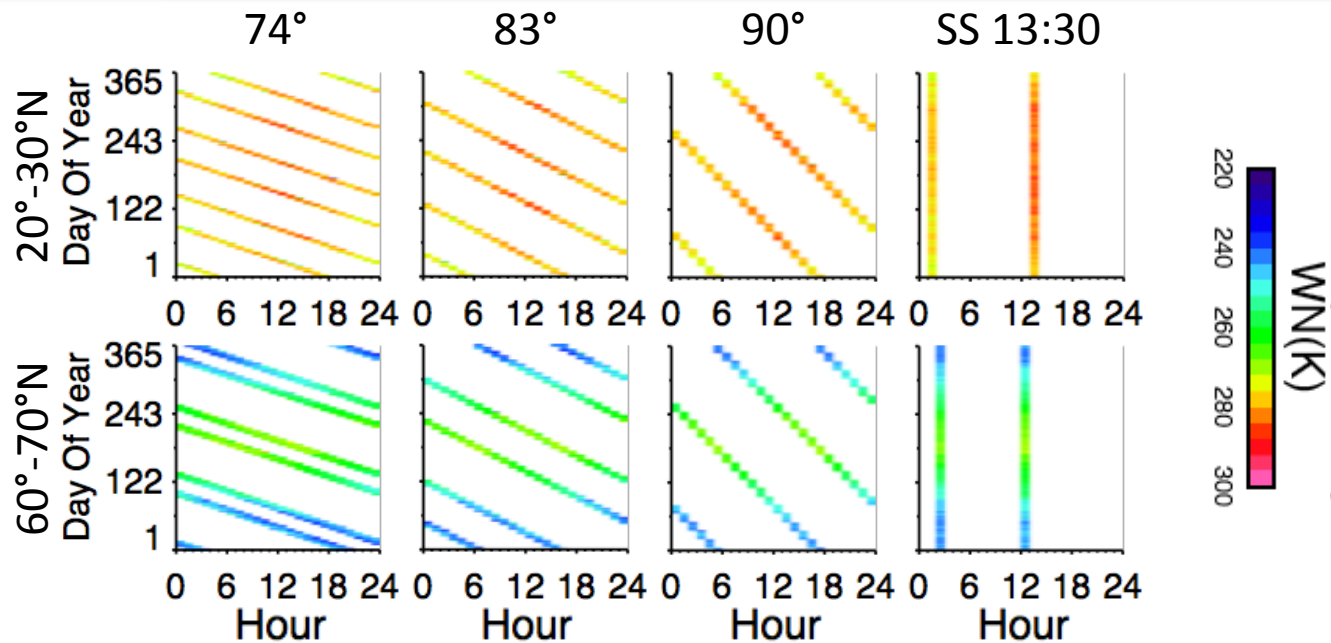


- Inter-annual variability due to ENSO is larger than seasonal or diurnal variability
- However the diurnal and seasonal cycles are very large
- Satellite sampling needs to detect the variability while observing large seasonal and diurnal oscillations



# CLARREO Examined Orbits

Orbit	74°	83°	90°	98° (SS)
Diurnal cycles/year	6	4	2	0
Comments	92.5% coverage	98.5% coverage	Global coverage	A-train, JPSS No diurnal coverage



- The inclination of the precessionary orbit determines the number of seasonal cycles sampled through out the year
- The precessionary orbit allows sampling the diurnal cycle

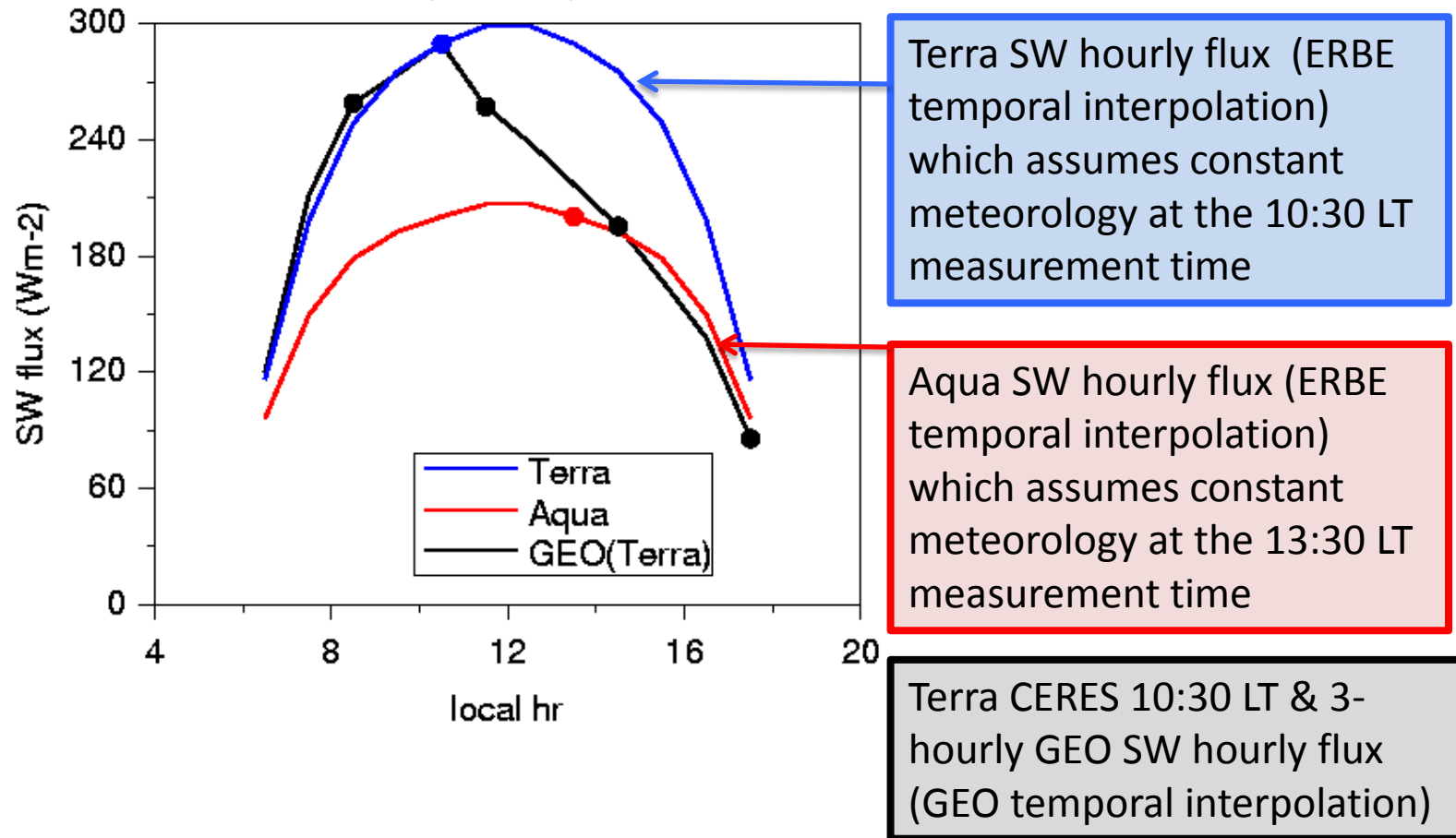
# CERES (natural variability) SW radiance dataset

- Use 5 years of (2001-2005) of hourly  $1^\circ$  ( $110\text{km}^2$ ) gridded broadband SW fluxes from the CERES Terra SRBAVG-GEO dataset
  - CERES observes WN (8-12 $\mu\text{m}$ ), LW broadband, SW broadband
  - Merged CERES Terra and 3-hourly 5-satellite GEO derived broadband fluxes
  - The GEO fluxes have been carefully normalized to the CERES fluxes to maintain CERES calibration
  - Temporally interpolate all measured fluxes to fill in all hourly increments
  - CLARREO measures radiances: need to convert fluxes into radiances
- Convert all the regional hourly SW fluxes to nadir radiance using CERES angular directional models (ADMs) based on over 600 scene types based on cloud and geo-type
  - All solar zenith angles (SZA) $<90^\circ$  are used
- Average all SW radiances into  $10^\circ$  zones for each of the dataset years



# The merged CERES/GEO SW diurnal flux

- Peruvian maritime stratus region example, where morning stratus clouds that burn off in the afternoon, expect greater SW flux in the morning than afternoon

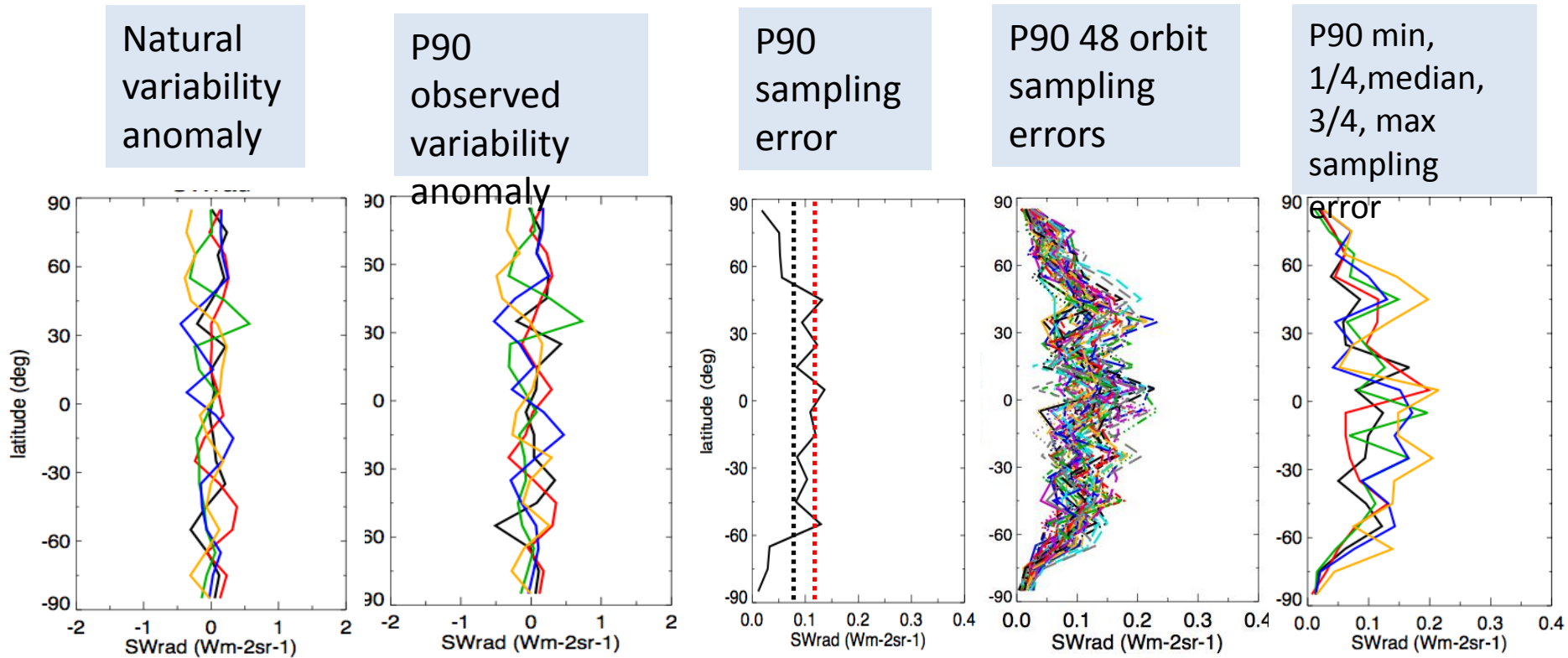


- The Terra 10:30 and Aqua 13:30 cannot replicate diurnal coverage
- Use Geostationary derived fluxes to complete diurnal coverage

# Sampling strategy

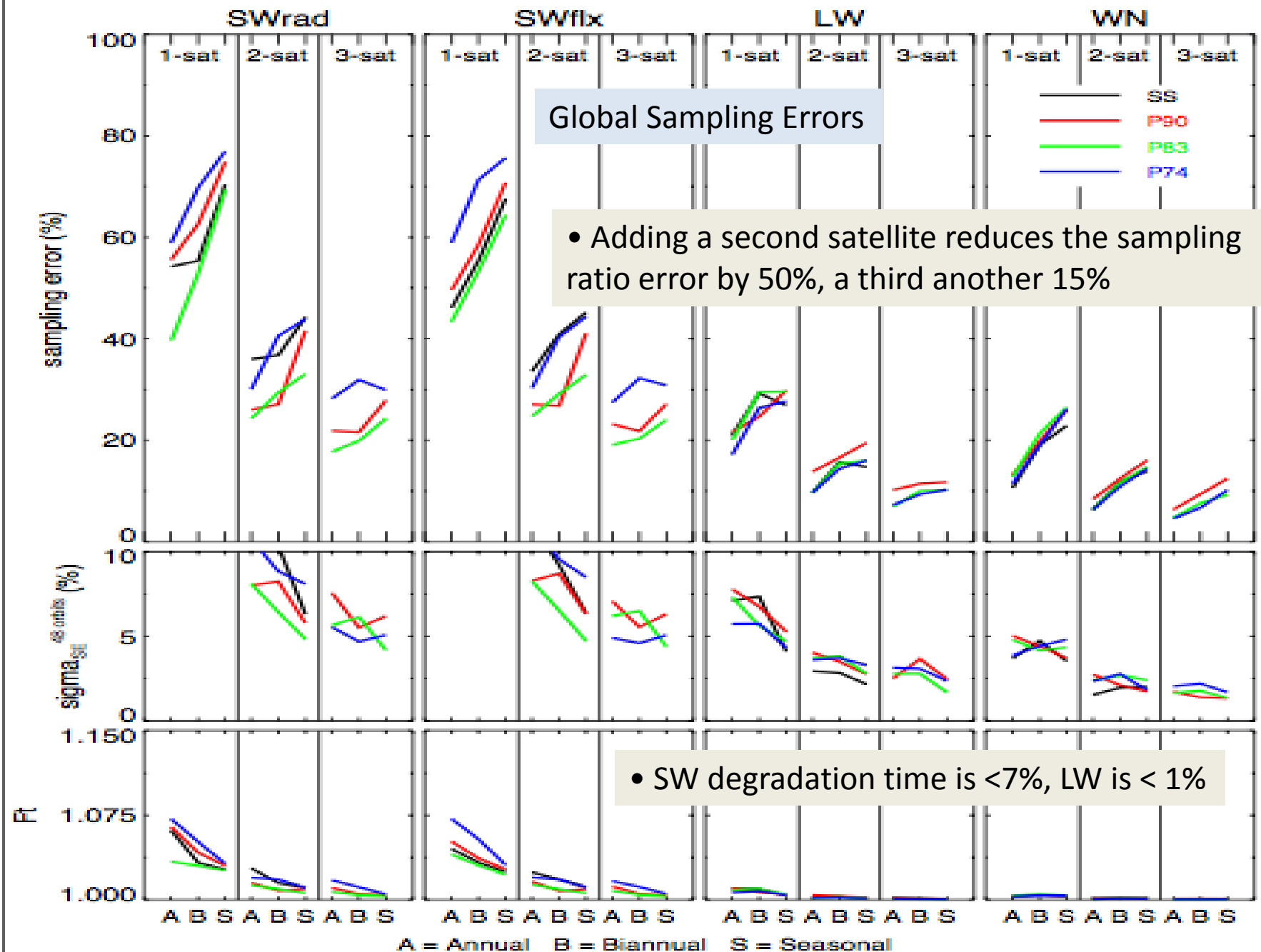
- Generate predicted CLARREO satellite ground-track files containing longitude, latitude, time and solar zenith angles (SZA)
  - Simulate the Precessionary  $90^\circ$  (P90) orbit
  - Generate the 1:30PM and 10:30 AM Sun Synchronous (SS) orbit
  - Assume  $100^{\text{km}}$  footprint (spatial resolution of CERES grid)
  - Assume 15 second ( $110 \text{ km}$ ) along ground track sampling
- The CERES dataset contains the nadir hourly radiances on a  $1^\circ$  by  $1^\circ$  latitude by longitude grid for 5 years
  - Sample the nadir radiance from the CERES dataset, every 15 seconds, from the region containing the ground track latitude and longitude
- Average all sampled SW and LW radiances into  $10^\circ$  zones for each of the dataset years

# SW P90 Sampling Error

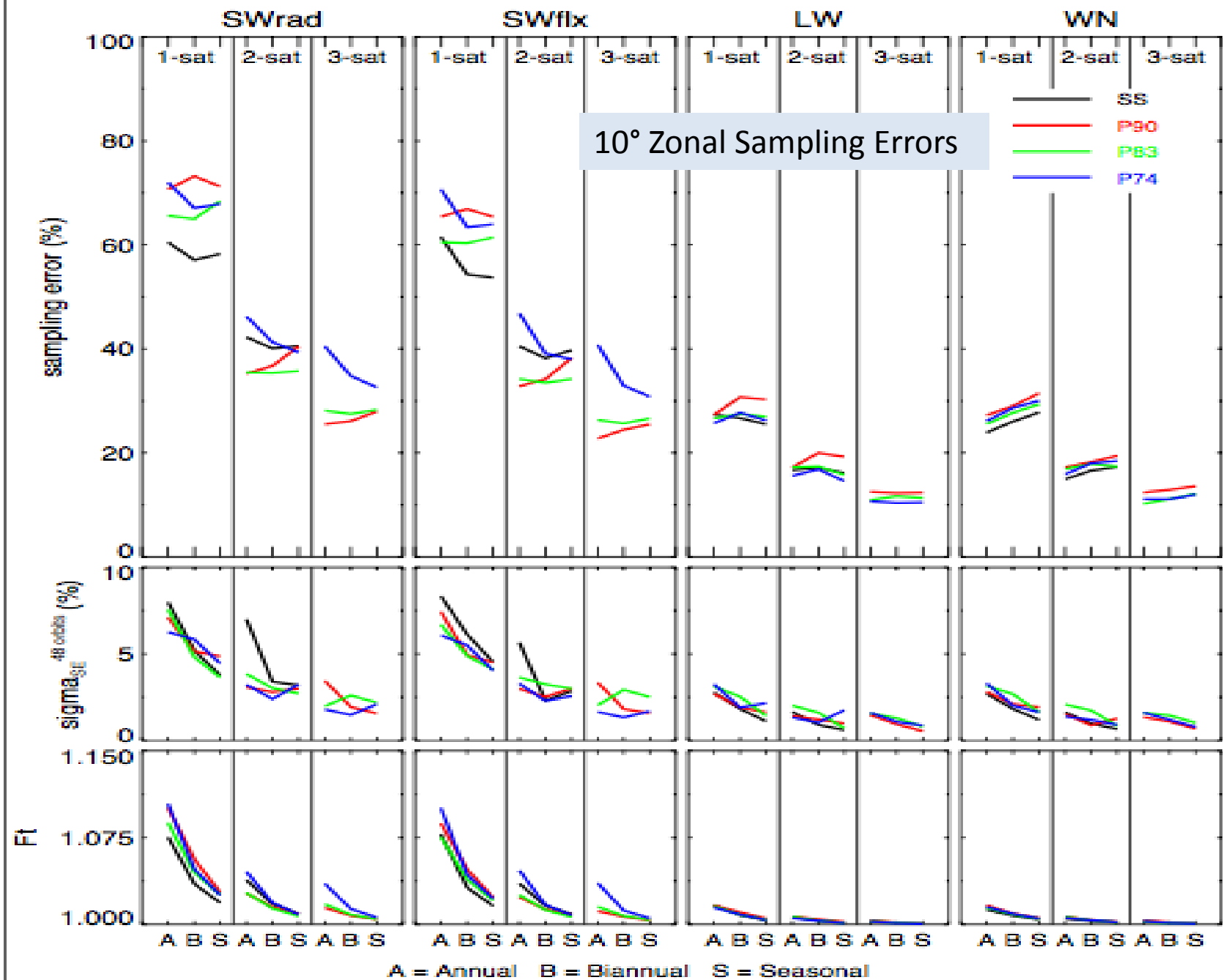


SW radiance (Wm-2sr-1)	Natural 1-sigma	Sampled RMS	Sampled (median) RMS (+1sigma)	Sampling (median) error ratio (%)	Sigma 48 orbits error (%)	Ft
Global	0.055	0.029	-	53	17	1.06
Zonal	0.192	0.101	0.135	70	7	1.10

# CLARREO global sampling error

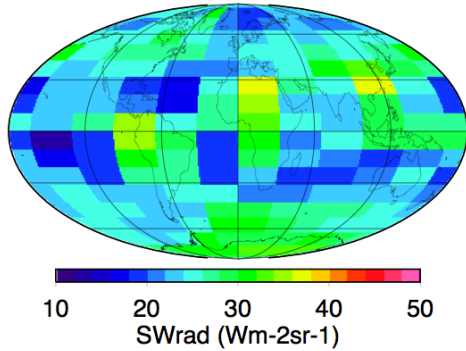


# CLARREO 10-deg zonal sampling error

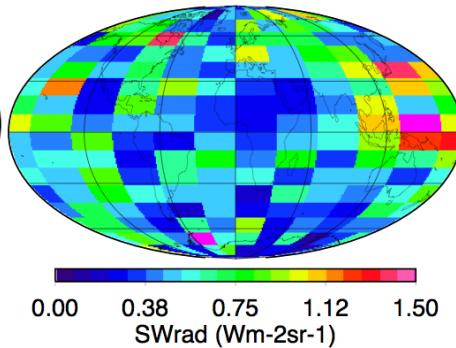


# SW P90 Regional Sampling Error

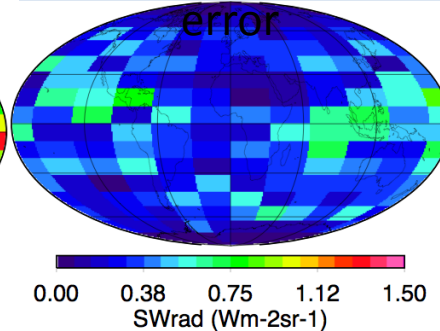
5-year SWrad mean



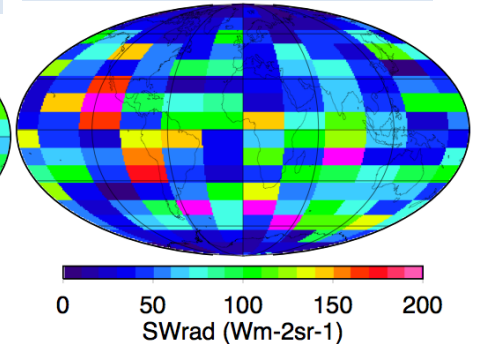
SWrad Natural  
variability anomaly



P90 median  
sampling RMS  
error

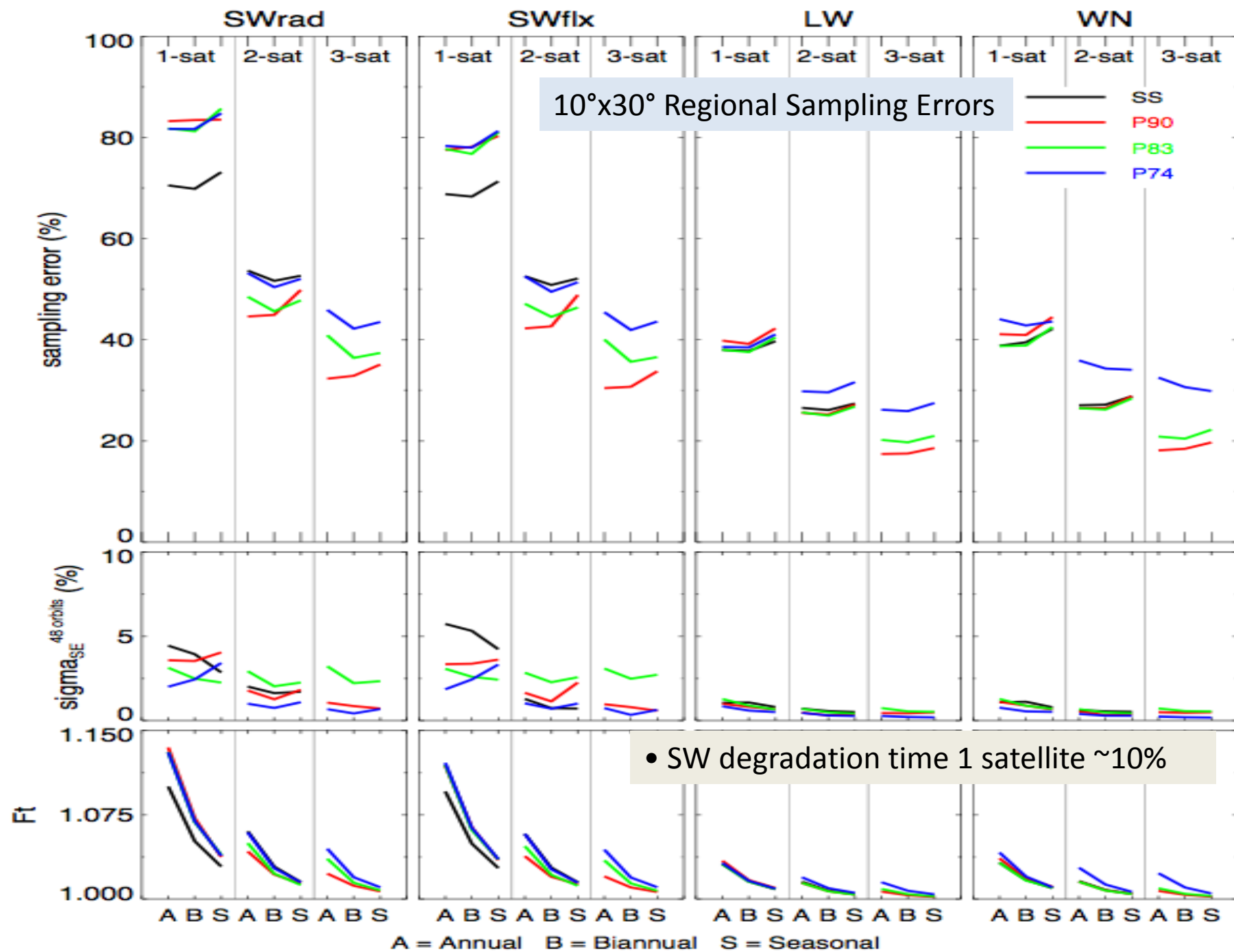


P90 sampling error  
ratio (%)



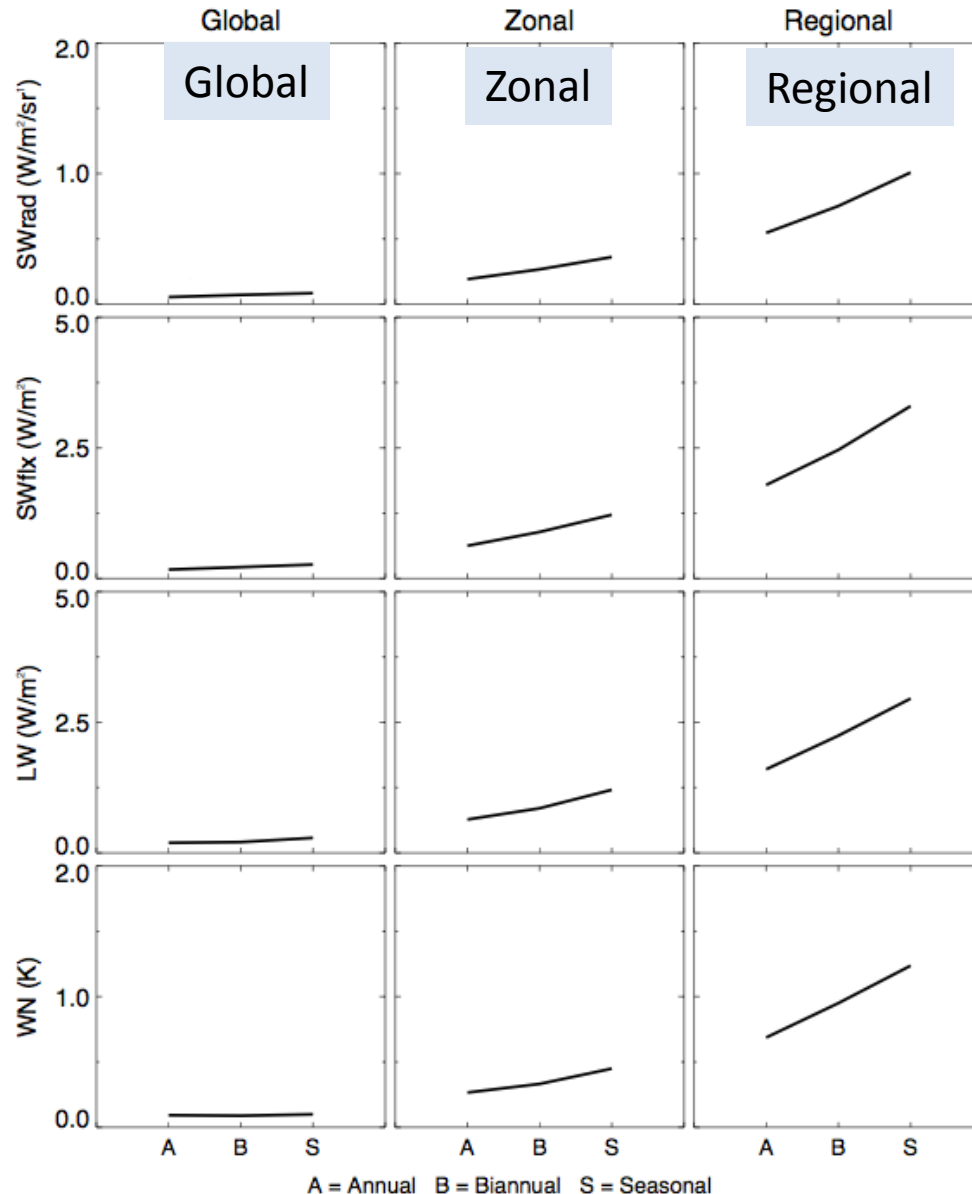
SW radiance (Wm-2sr-1)	Natural 1-sigma	Sampled RMS	Sampled (median) RMS(+1sigma)	Sampling (median) error ratio (%)	Sigma 48 orbits error (%)	Ft
Regional	0.546	0.317	0.454	83	~4	1.13

# CLARREO 10x30-deg regional sampling error





# Natural Variability Anomalies



- Smaller time steps have increased natural variability.
- This implies that detecting the same trend at the seasonal scale will take a lot longer than at the global scale.

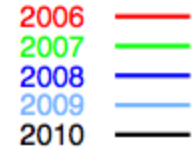
# Benchmarking Conclusions

- Adding a second satellite reduces the sampling ratio error by 50%, a third another 15%
- The Zonal sampling error remains constant whether working with annual, semi-annual, or seasonal time scales
  - Natural variation increases with smaller time and spatial scales increasing time to detect trend
  - Sampling error ratio is constant with time scale
  - $F_t$  decreases with higher time resolutions
- One P90 orbit provides sufficient LW sampling at the ~25% sampling error ratio and  $F_t = 1.01$ , for zonal annual case
- One P90 orbit provides sufficient SW sampling at the ~70% sampling error ratio and  $F_t = 1.10$ , for zonal annual case
  - Only half the measurements of LW
  - 1:30PM orbit SW sampling error is slightly lower than the P90 orbit
- Loss of sampling due to JPSS and MetOP inter-calibration ~1000/year @5 minute events (1% data loss) increased the sampling error by 5%
  - However inter-calibration is systematic, not randomly distributed

# CLARREO defunded, seek other satellite options

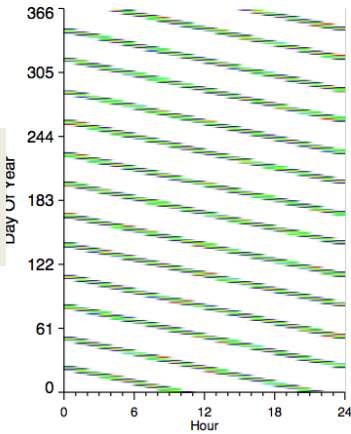
- International Space Station
  - 51° precessing orbit, with altitude adjustments over time
  - 2006-2010 ground track data using 2001-2005 CERES data
  - ~12 diurnal cycles/year, non-repeatable annual orbits
- Iridium
  - 86° precessing orbit
  - 2006-2010 ground track data using 2001-2005 CERES data
  - Multiple orbits, offset ground track every 7.5° in longitude for 48 orbits
  - ~2.2 diurnal cycles/year, non-repeatable annual orbits

# ISS sampling



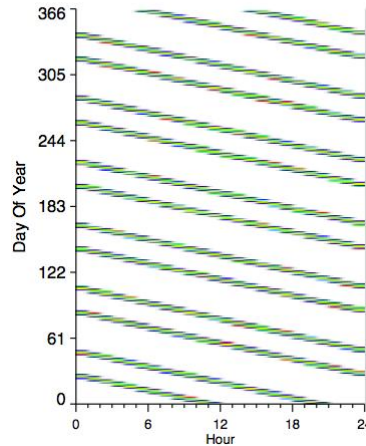
0-10N

Number of Samples 2007  
10N-0N  
0 75 150 225 300



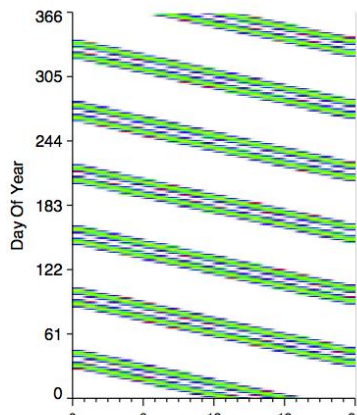
20-30N

Number of Samples 2007  
20N  
0 75 150 225 300



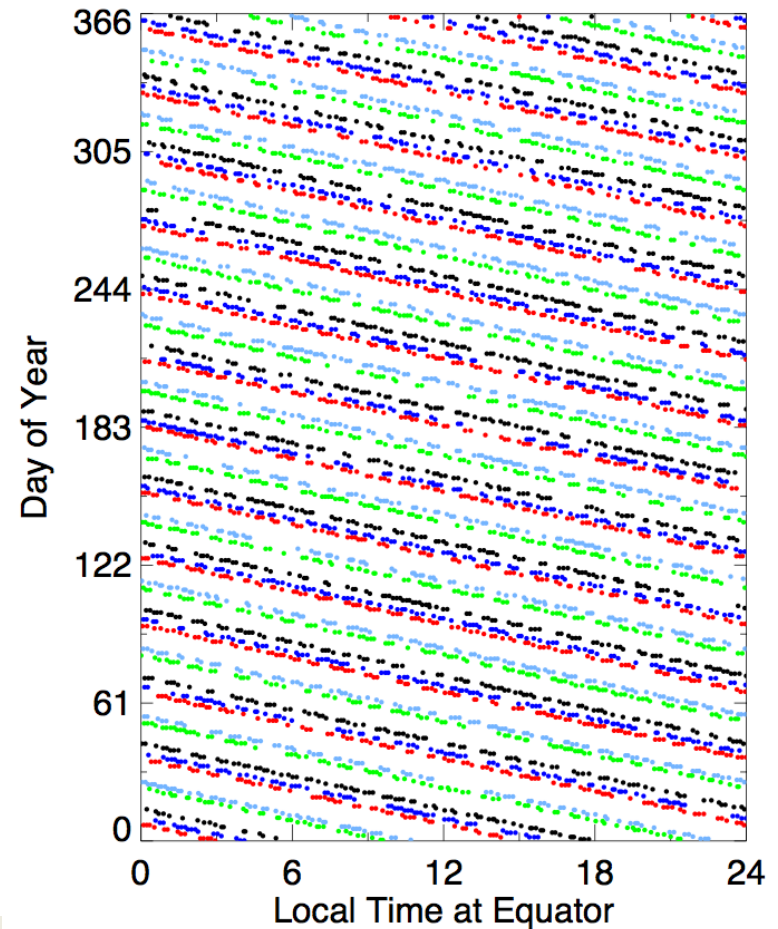
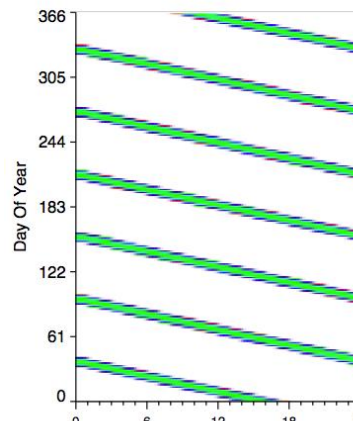
40-50N

Number of Samples 2007  
40N-30N  
0 75 150 225 300



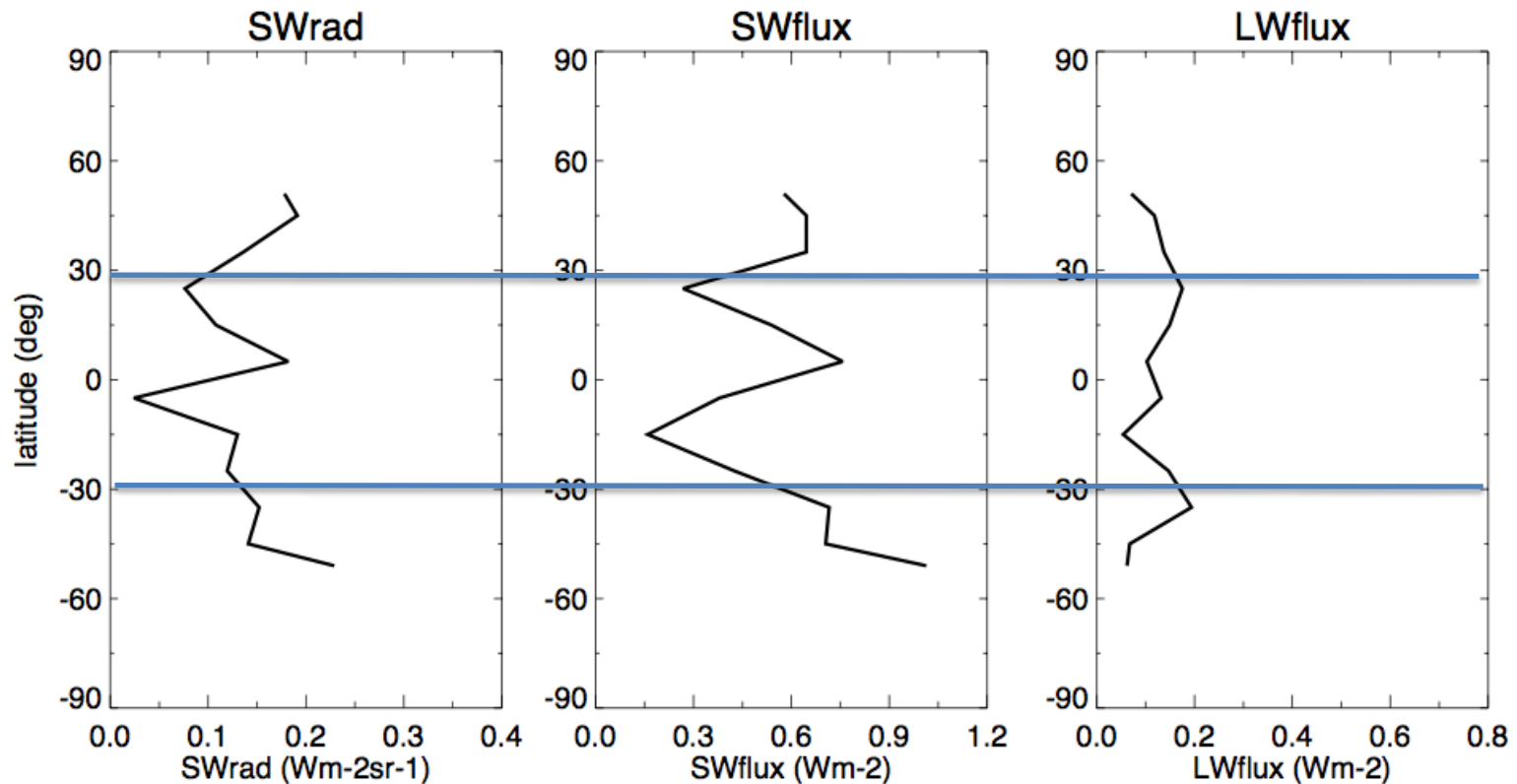
50-60N

Number of Samples 2007  
50N-40N  
0 75 150 225 300



- The annual sampling is not repeated
- These are very similar to some non-maintained orbit sampling studies last summer

# ISS annual sampling



## **±60° latitude**

Global Sampling ratio=	1.09	2.09	0.22
Zonal	0.98	1.28	0.27

## **±30° latitude**

Global Sampling ratio=	0.37	1.17	0.10
Zonal	0.95	1.14	0.26

# ISS Sampling Error/Natural Variability Table

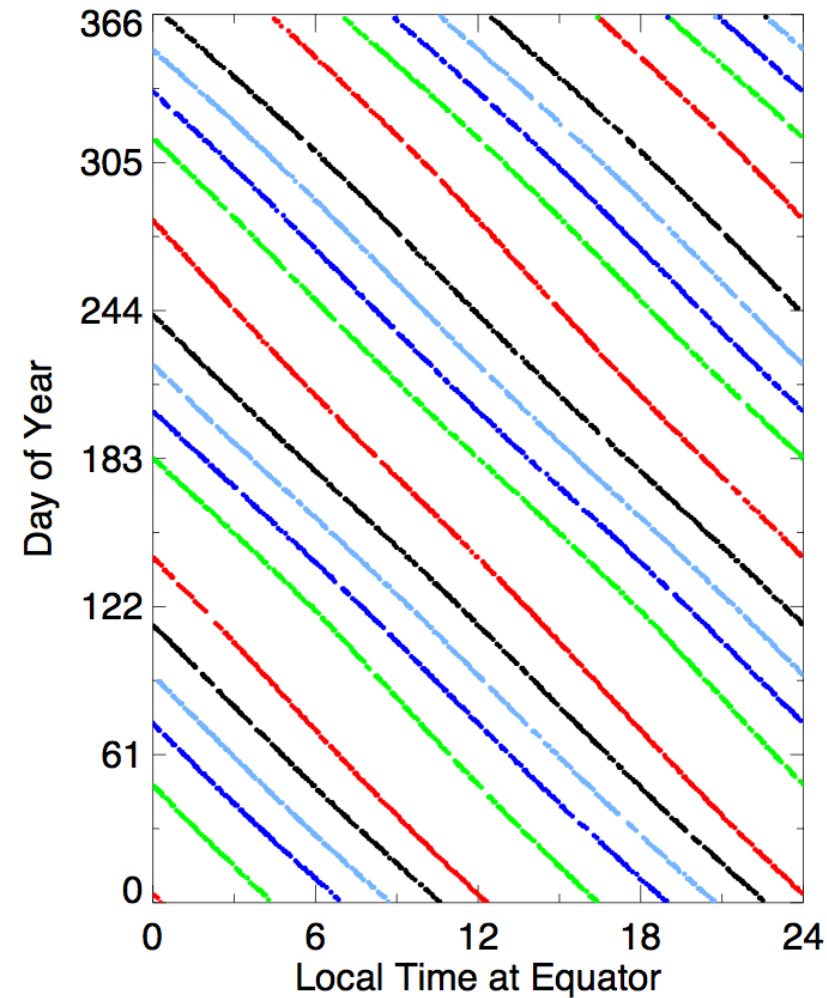
<b>RMS(SAMP)/TRUTH (%)</b>				
<b>ZONAL 60</b>	Swrad	SWflx	LWflx	WNflx
Annual	98	128	27	29
Semi	111	155	23	27
Quarter	120	142	43	59
<b>GLOBAL 60</b>	Swrad	SWflx	LWflx	WNflx
Annual	109	209	22	19
Semi	154	313	23	24
Quarter	129	213	35	45
<b>ZONAL 30</b>	Swrad	SWflx	LWflx	WNflx
Annual	95	114	26	27
Semi	80	120	20	23
Quarter	78	98	28	38
<b>GLOBAL 30</b>	Swrad	SWflx	LWflx	WNflx
Annual	37	117	10	11
Semi	45	120	14	13
Quarter	66	134	15	15

- The global sampling error is reduced by half sampling within the tropics
- The LW sampling error is unaffected by non-repeatable annual orbits

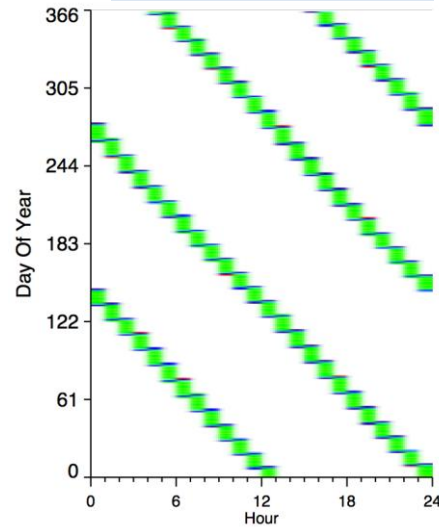
# Iridium

Local Time at Equator

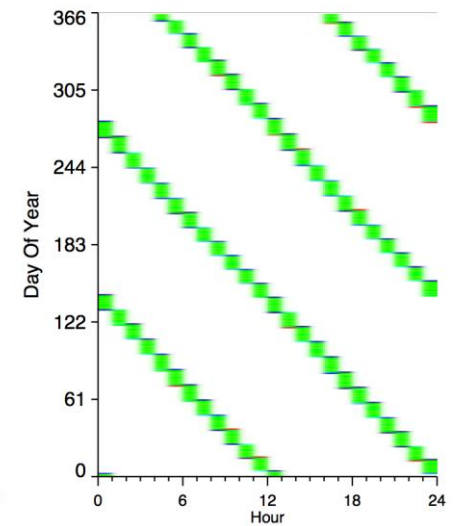
2006 —  
2007 —  
2008 —  
2009 —  
2010 —



60-70°N

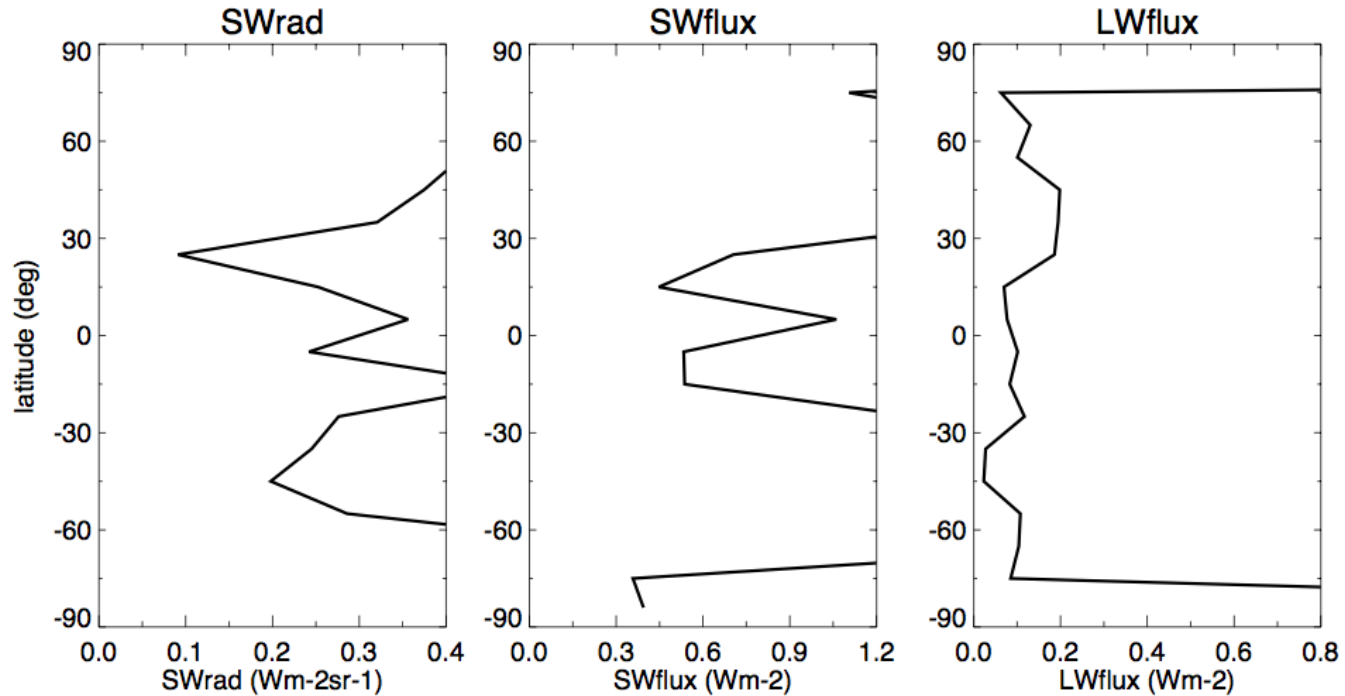


20-30°N





# Iridium Annual Sampling



## **±80° latitude**

Global Sampling ratio=	2.74	2.79	0.36
Zonal	2.86	3.57	0.26

# Iridium ISS Sampling Error/Natural Variability Table

<b>ZONAL 80</b>	Swrad	SWflx	LWflx	WNflx
Annual	286	357	26	26
Semi	246	371	33	37
Quarter	254	574	54	68
<b>GLOBAL 80</b>	Swrad	SWflx	LWflx	WNflx
Annual	274	279	36	21
Semi	215	865	75	58
Quarter	336	1712	131	136

- Zonal and Global SW sampling ratio ~250%,  $F_t \sim 1.75$
- Zonal and Global LW sampling ratio ~30%
- The LW/WN sampling error is unaffected by nonrepeatable annual orbits

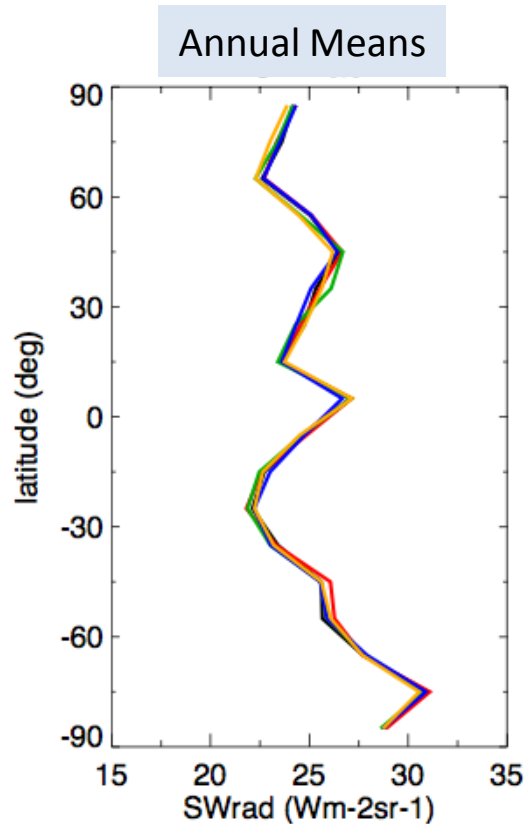
# Conclusions

- ISS sampling,  $51^\circ$  precessing,  $\sim 12$  diurnal cycle/year
  - SW zonal  $\pm 60^\circ$  sampling ratio=95%,  $F_t=1.2$
  - SW global  $\pm 30^\circ$  sampling ratio=37%,  $F_t=1.02$
  - LW zonal  $\pm 60^\circ$  sampling ratio=26%,  $F_t=1.02$
  - LW global  $\pm 30^\circ$  sampling ratio=10%,  $F_t=1.01$
- Iridium sampling,  $86^\circ$  precessing,  $\sim 2.2$  diurnal cycle/year
  - SW zonal  $\pm 80^\circ$  sampling ratio=250%,  $F_t=1.75$
  - SW global  $\pm 80^\circ$  sampling ratio=275%,  $F_t=1.80$
  - LW zonal  $\pm 80^\circ$  sampling ratio=36%,  $F_t=1.02$
  - LW global  $\pm 80^\circ$  sampling ratio=26%,  $F_t=1.02$
- Are annual orbits needed?

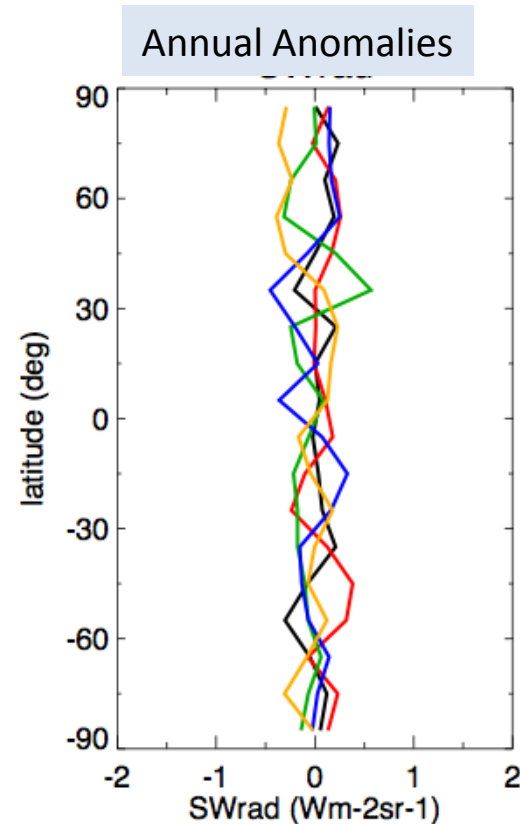
# Backup Slides

# SW Natural variability (from CERES)

The annual mean is the average of all hourly radiances in the CERES dataset over the year in a 10° zone



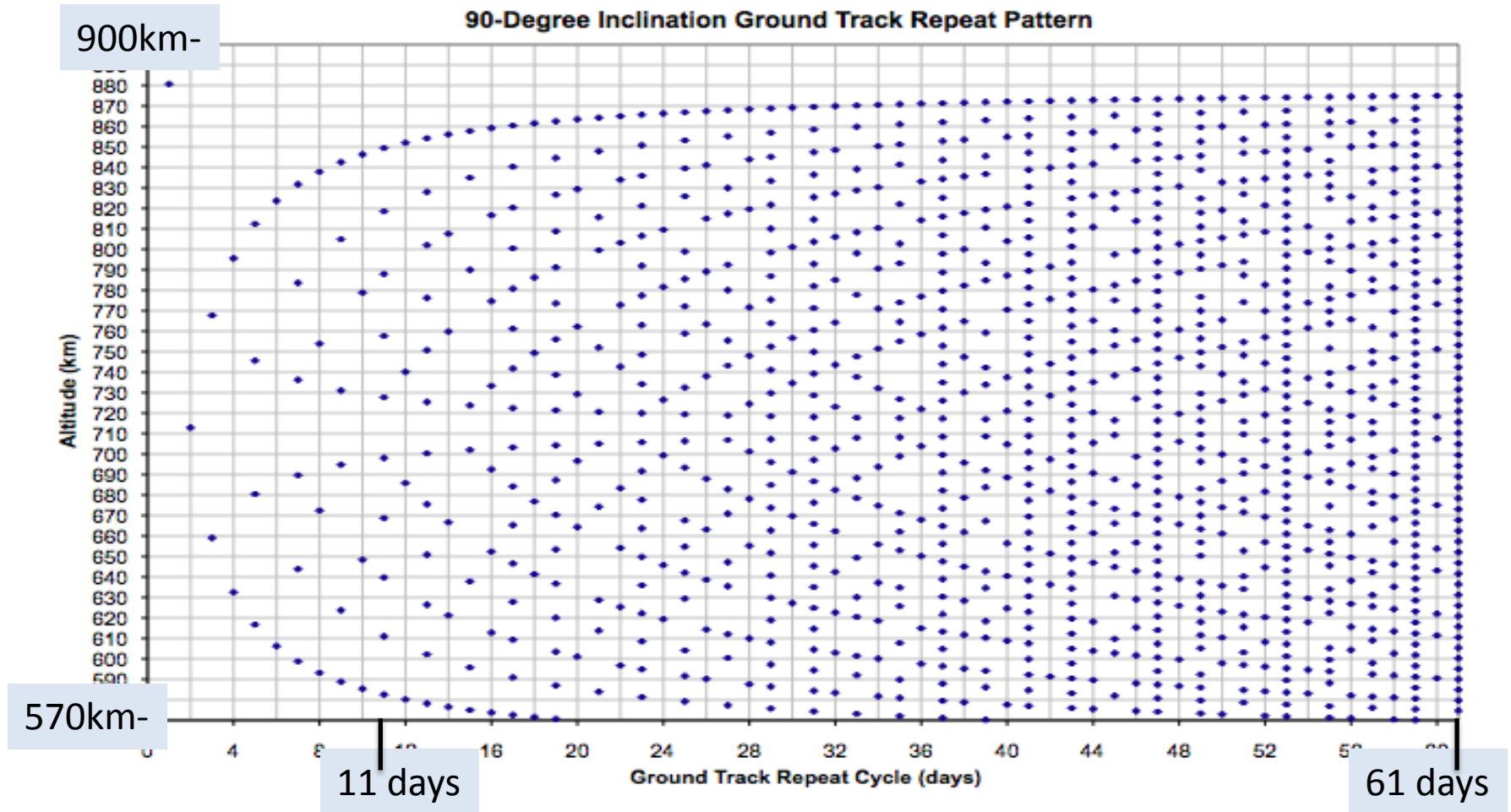
2001	24.80
2002	24.85
2003	24.72
2004	24.74
2005	24.75
5-year Mean	24.77
Global 1-sigma	0.05



2001	0.028
2002	0.080
2003	-0.059
2004	-0.029
2005	-0.020
5-year Mean	24.774
Global 1-sigma	0.055
Zonal 1-sigma	0.192

The annual anomaly is computed using the 5-year mean

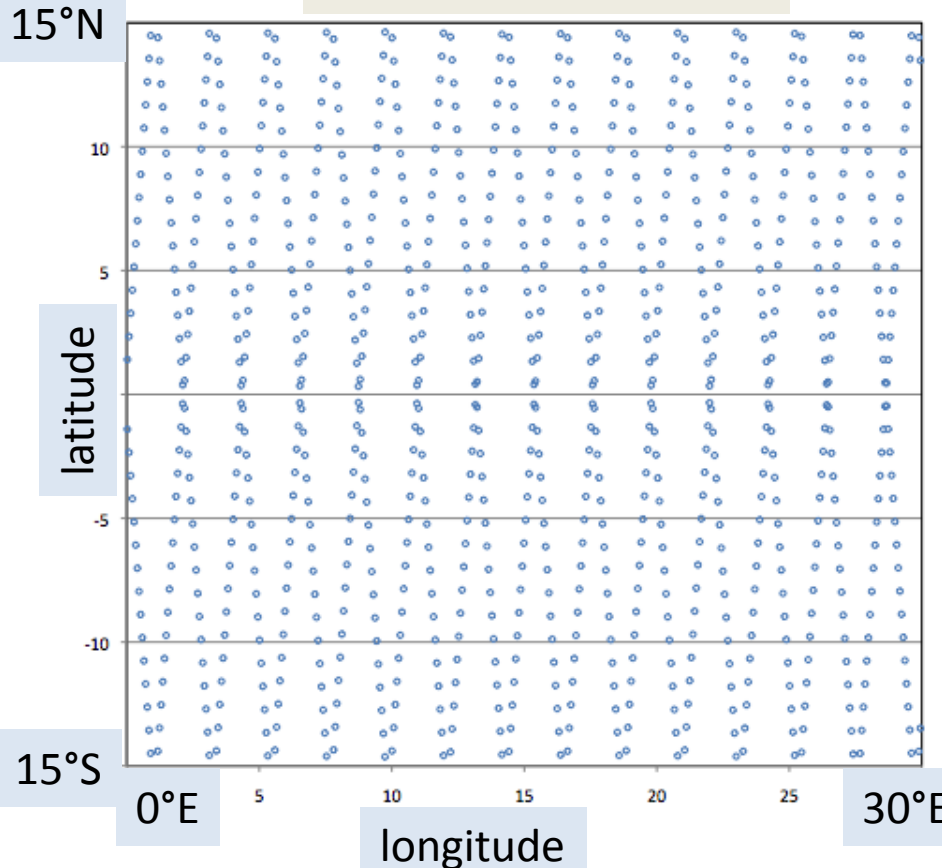
# Altitude vs ground track repeat cycle for 90° orbit



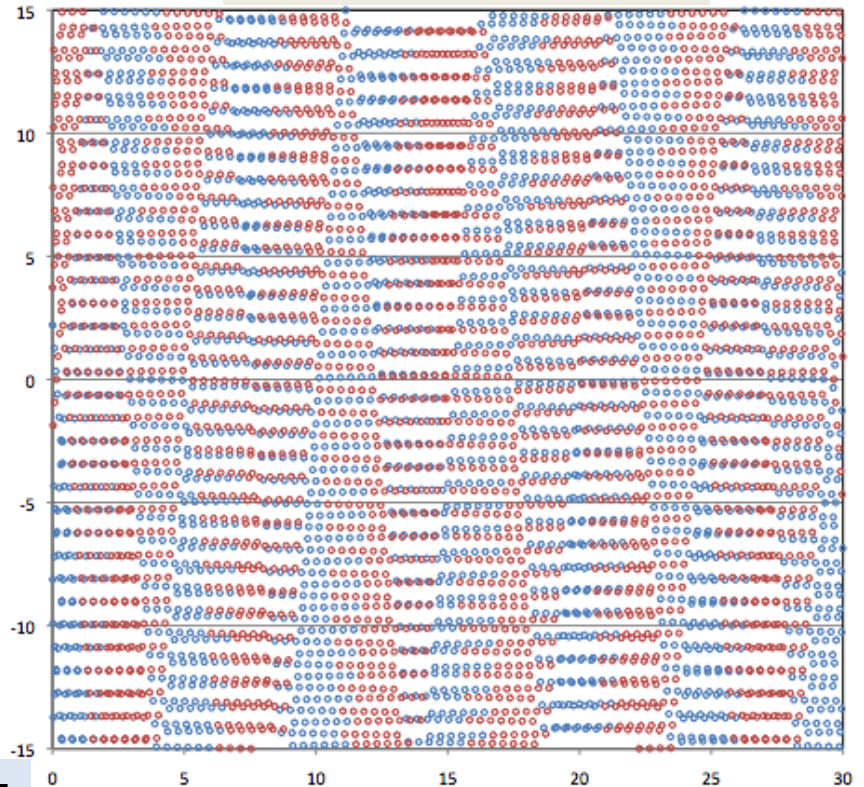
- Ground track repeat cycle is very dependent on altitude
- Pick altitude with greatest repeat cycle
- This study uses 61 day repeat cycle

# 11 vs 61 day repeat cycle

11 day, 616km altitude



61 day, 609km altitude



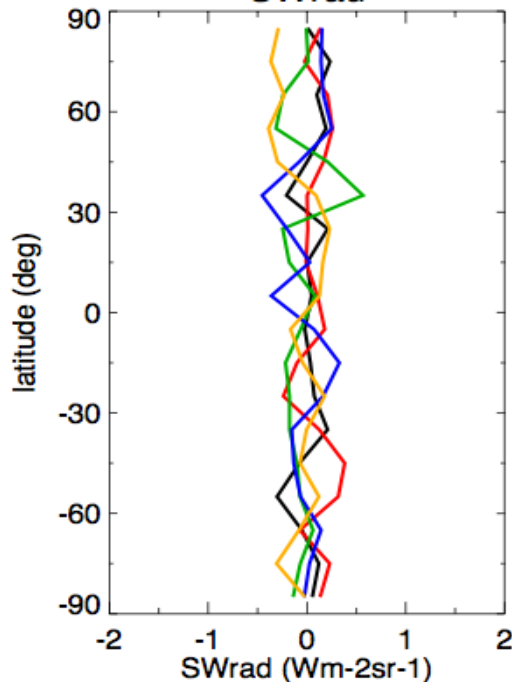
Blue first 30 days  
Red second 30 days

- Each dot is 25km footprint, every 15 seconds
- Note the complete spatial sampling in the 61 day repeat cycle
- Use the preferred 609km altitude for P90



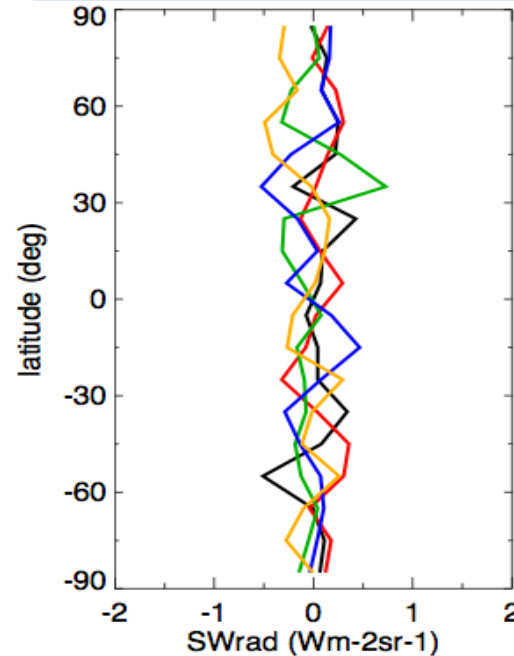
# Sampling RMS Error

Natural Variability



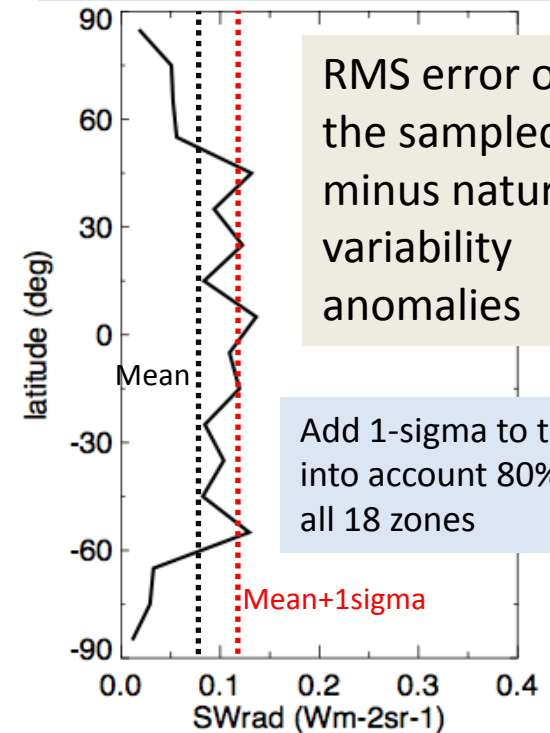
2001	0.028
2002	0.080
2003	-0.059
2004	-0.029
2005	-0.020
5-year Mean	24.774
Global 1-sigma	0.055
Zonal 1-sigma	0.192

Single 90° orbit sampling



	P90	Truth
2001	0.072	0.028
2002	0.069	0.080
2003	-0.052	-0.059
2004	-0.024	-0.029
2005	-0.066	-0.020
5-year Mean	24.838	24.774
Global 1-sigma	0.066	0.055
Zonal 1-sigma	0.225	0.192

Single 90° sampling RMS error

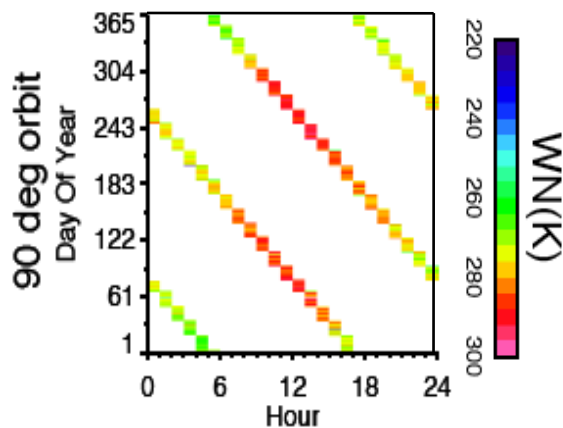


	P90	Truth	
	RMS	1-sigma	53%
Global	0.029	0.055	
Zonal	Mean 0.080	0.192	42%
Zonal	Mean+1sigm 0.116	0.192	60%

- The annual zonal anomaly sampling error for P90 is  $(\sigma_{\text{sampling}}/\sigma_{\text{var}}) = 0.60$ ,  $F_t = 1.10$
- For this case, assuming sampling error only, the time to detect trend is 10% greater than perfect observing system

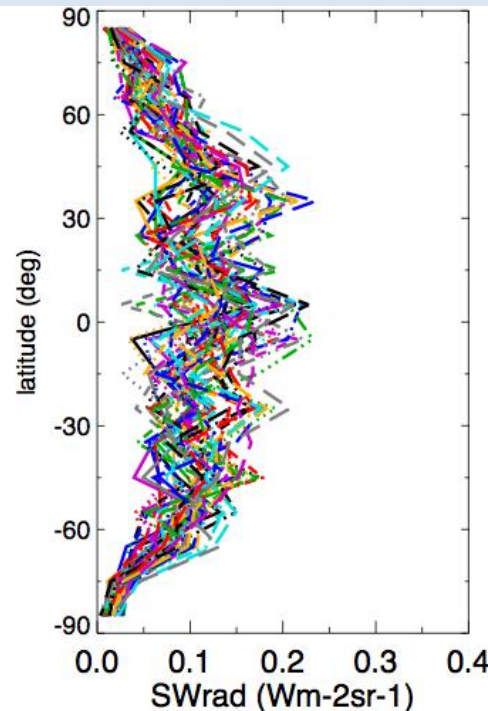
# SW Sampling RMS Error

P90 sampling pattern for the 20°-30° zone of local hour vs day of year



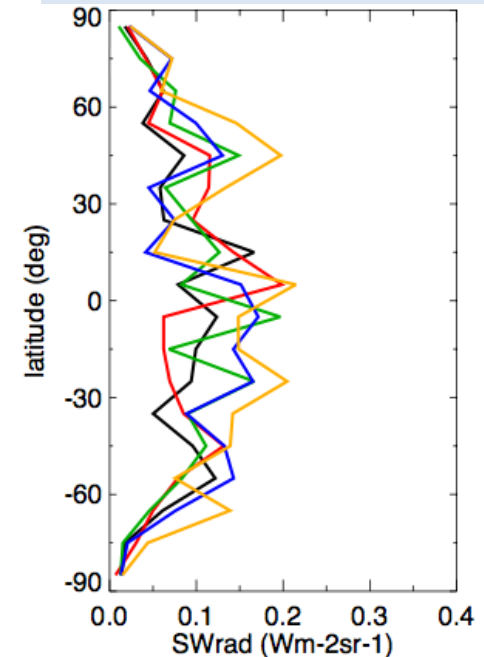
- By changing the start time of the orbit between 6 and 18 local time may have an impact on the sampling RMS error, since you are sampling the seasonal cycle at different times of day

90° sampling RMS errors for all 48 start time



- Use the median RMS error for statistics

All 48 start times, sorted from lowest to highest sampling error



Zonal RMS	P90	Truth
min	0.113	
1/4	0.127	
med	0.135	
3/4	0.144	
max	0.175	
Zonal 1-sigma		0.192

ZONAL RMS of Mean + 1sigma  
Sampling error ( $\sigma_{\text{sampling}}/\sigma_{\text{var}}$ ) = 70%

# 10° Zonal Inter-annual sampling error

Annual	ZONAL					
	SWrad (Wm-2sr-1)		Swflux (Wm-2)		LW (Wm-2)	
	$\sigma_s/\sigma_{var}$ (%)	$F_t$	$\sigma_s/\sigma_{var}$ (%)	$F_t$	$\sigma_s/\sigma_{var}$ (%)	$F_t$
$\sigma_{var}$ [SS]	.197		.657		.637	
SS 13:30	59	1.07	58	1.07	26	1.01
SS 13:30+10:30	42	1.04	41	1.04	16	1.01
$\sigma_{var}$ [P90]	.192		.628		.640*	
P90-1	70	1.10	65	1.09	25	1.01
P90-2	35	1.03	33	1.02	16	1.01
P90-3	26	1.01	23	1.01	12	1.00

\* For LW  $0.640 \text{ Wm}^{-2} = 0.194^\circ\text{K}$

- Adding a second satellite reduces the sampling ratio error by 50%, a third another 15%
- Single SS has a slightly reduced **SW** sampling error than on P90, but for two satellites, the P90 orbit is preferred
- All combinations of orbits have a very small  $F_t$  **LW** error <1.01 from perfect observing system

# 10° Zonal Bi-annual sampling error

Bi-annual	ZONAL					
	SWrad (Wm-2sr-1)		SWflux (Wm-2)		LW (Wm-2)	
	$\sigma_s/\sigma_{var}$ (%)	$F_t$	$\sigma_s/\sigma_{var}$ (%)	$F_t$	$\sigma_s/\sigma_{var}$ (%)	$F_t$
$\sigma_{var}$ [SS]	0.273		0.916		0.843	
SS 13:30	58	1.04	52	1.03	26	1.01
SS 13:30+10:30	40	1.02	40	1.02	17	1.00
$\sigma_{var}$ [P90]	0.267		0.893		0.854	
P90-1	73	1.06	67	1.05	34	1.01
P90-2	40	1.02	37	1.01	22	1.01
P90-3	30	1.01	27	1.01	14	1.00

- Similar observations can be made for the Bi-annual case as with the annual except that the tau-sampling term is half of the annual case

# 10° Zonal Seasonal sampling error

Seasonal	ZONAL					
	SWrad (Wm-2sr-1)		SWflux (Wm-2)		LW (Wm-2)	
	$\sigma_s/\sigma_{var}$ (%)	$F_t$	$\sigma_s/\sigma_{var}$ (%)	$F_t$	$\sigma_s/\sigma_{var}$ (%)	$F_t$
$\sigma_{var}$ [SS]	0.371		1.260		1.201	
SS 13:30	66	1.02	59	1.02	24	1.00
SS 13:30+10:30	45	1.01	41	1.01	14	1.00
$\sigma_{var}$ [P90]	0.361		1.221		1.208	
P90-1	75	1.03	67	1.02	29	1.00
P90-2	42	1.01	39	1.01	18	1.00
P90-3	28	1.00	25	1.00	11	1.00

- Similar observations can be made for the seasonal case as with the annual except that the tau-sampling term is a quarter of the annual case

# 10° x 30° Inter-annual sampling error

Annual	Regional					
	SWrad (Wm-2sr-1)		SWflux (Wm-2)		LW (Wm-2)	
	$\sigma_s/\sigma_{var}$ (%)	$F_t$	$\sigma_s/\sigma_{var}$ (%)	$F_t$	$\sigma_s/\sigma_{var}$ (%)	$F_t$
$\sigma_{var}$ [SS]	0.540		1.786		1.565	
SS 13:30	94	1.17	87	1.15	50	1.05
SS 13:30+10:30	75	1.11	63	1.08	31	1.02
$\sigma_{var}$ [P90]	0.541		1.794		1.563	
P90-1	105	1.20	101	1.19	55	1.06
P90-2	56	1.07	52	1.06	32	1.02
P90-3	38	1.03	36	1.03	23	1.01

- regional errors are the mean + 1 sigma of 216 regions
- The annual regional resolution is on the cusp of single satellite **SW** sampling error

# Single satellite sampling error

Time/Space	Regional					
	SWrad (Wm-2sr-1)			LW (Wm-2)		
	$\sigma_{\text{var}}$ (Wm-2sr-1)	$\sigma_s/\sigma_{\text{var}}$ (%)	$F_t$	$\sigma_{\text{var}}$ (Wm-2)	$\sigma_s/\sigma_{\text{var}}$ (%)	$F_t$
SS 13:30						
Annual Zonal	0.197	59	1.07	0.637	26	1.01
Bi-annual Zonal	0.273	58	1.04	0.843	26	1.01
Seasonal Zonal	0.371	66	1.02	1.201	24	1.00
Annual Regional	0.540	94	1.17	1.565	50	1.05
P90-single					* For LW $0.640\text{Wm}^{-2} = 0.194^\circ\text{K}$	
Annual Zonal	0.192	70	1.10	0.640*	25	1.01
Bi-annual Zonal	0.267	73	1.06	0.854	34	1.01
Seasonal Zonal	0.361	75	1.03	1.208	29	1.00
Annual Regional	0.541	105	1.20	1.563	55	1.06

- Note the increase in natural variability progressing to higher temporal and spatial resolutions
- The SW P90 zonal sampling error ratio remains fairly constant for temporal resolutions
- The SW P90 zonal  $F_t$  decreases with increasing temporal resolution
- The annual regional is on the cusp of single satellite sampling
- The SW sampling error ratio is  $\sim 2\times$  > then LW, since SW is only available during daytime